

LECTURE 5:  
AUCTIONS

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Games and Decisions

# Auctions – A Brief History

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- **auctions:** an alternative to take-it-or-leave-it pricing, competition of potential buyers

*Babylonian empire (500 BC):* auctions of women for marriage

*Roman empire:* auctions to liquidate the assets of debtors whose property had been confiscated

*17<sup>th</sup> – 18<sup>th</sup> century, Europe:* auctions to sell pieces of art, the birth of many auction houses that still work today:

- 1674: Stockholm Auction House
- 1744: Sotheby's
- 1766: Christie's
- ...



*Today:* online auctions for all kinds of things (*eBay, eBid, Aukro,...*)

# Types of Auctions

## Famous types of auctions:

- *English auction* (a.k.a. *open ascending price auction*)
  - the most widespread auction type (the typical art auctions)
  - open bidding, bidders know the others' bids
  - various rule modifications (ending rules – e.g. “auction by candle”)
- *Dutch auction* (a.k.a. *open descending price auction*)
  - the auctioneer cries out gradually descending price bids, the first one to accept the price is the buyer
  - cut flower sales in the Netherlands, perishable goods (fish, tobacco)
- *Envelope auction* (a.k.a. *first-price sealed-bid auctions*)
  - bidders can only submit one bid each (typically, in a sealed envelope)
  - the sale of real estate and securities (used a lot in the post-communist countries)
- *Vickrey auction* (a.k.a. *second-price sealed-bid auctions*)
  - “designed” by William Vickrey in 1961
  - used to auction off collectible stamps



## Basic classification of auction rules:

- *ascending/descending*
  - ▣ the direction of bid increments
- *open/sealed-bid*
  - ▣ open – bidders submit the bids publicly and after one another
  - ▣ sealed-bid – bidders submit the bids secretly and simultaneously
- *first-price/second-price*
  - ▣ winner pays the highest/second-highest bid
- *single object/multi-object auction*
  - ▣ number of objects auctioned at the same time
- *reserve/no-reserve*
  - ▣ the seller can state a reserve price – the minimum price of the auctioned object
  - ▣ no-reserve auctions – can attract more bidders (?)
- ...

## Some other auction types:

- *All-Pay Auctions*
  - used for charity auctions
  - various schemes (paying all bids or paying all increments + the whole of the winning bid)
- *Auctions with Buyout Option*
  - the seller can state a buyout price – for immediate purchase
- *Combinatorial Auctions*
  - multi-object auctions, bidding for bundles of objects
  - ferry lines, airport landing slots (it only makes sense to have bundles)
  - winner determination problem, preference expression problems
- *Online Timeshift Auctions*
  - fixed-time English type
  - aim: make bidders bid before the closing timeshift interval

# Multi-Object Sealed-Bid Auctions

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## Basic auction rules:

- bidders submit one bid each
- bids are sealed (= secret) and simultaneous
- first-price auction (winner pays the highest bid)



## Additional assumptions (for mathematical modelling):

- *two bidders* only (can be relaxed easily; however, we want to use bi-matrix games as the modelling tool); bidders = *investor 1* and *2*
- investors possess information about the subjective value of each of the  $n$  auctioned objects:  $s_1, s_2, \dots, s_n$
- total amounts the bidders intend to invest are known:  $I_1, I_2$
- there's a reserve price for each object:  $d_1, d_2, \dots, d_n$   
(we assume that  $s_i \geq d_i$  for  $i = 1, 2, \dots, n$ )
- in case of equal non-zero bids, the object in question is sold to each of the investors with a probability of  $\frac{1}{2}$  (a fair lottery)

## Modelling the auction as a normal-form game:

- *strategy spaces* of the players:

$$X = \left\{ \mathbf{x} = (x_1, x_2, \dots, x_n); \sum_{i=1}^n x_i = I_1, x_i \in [d_i, s_i] \cup \{0\} \right\},$$

$$Y = \left\{ \mathbf{y} = (y_1, y_2, \dots, y_n); \sum_{i=1}^n y_i = I_2, y_i \in [d_i, s_i] \cup \{0\} \right\}.$$

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$y_i$  = player 2's bid for object  $i$

sum of the bids = the intended amount of total investment

it makes sense to bid either 0, or anything between the reserve price and the value of the object



# Multi-Object Sealed-Bid Auctions

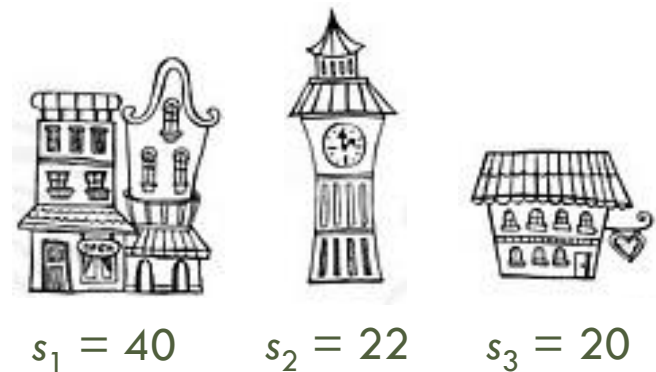
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- in general, these strategy spaces can be *infinite*
- however, it is usually required that the bids must be an integer multiple of a specified monetary unit  $\rightarrow$  *finite* strategy spaces (which enables the bimatrix approach)

## Example 1:

- three objects ( $n = 3$ )
- values:  $s_1 = 40$ ,  $s_2 = 22$ ,  $s_3 = 20$
- reserve price 10 for all objects ( $d_1 = d_2 = d_3 = 10$ )
- total investment:  $I_1 = 20$ ,  $I_2 = 10$
- bids must be integer multiples of 10
- strategy spaces (expressed in multiples of 10 for brevity):



$X = \{(2,0,0), (0,2,0), (0,0,2), (1,1,0), (1,0,1), (0,1,1)\}$   $\leftarrow$  6 pure strategies, sum = 2

$Y = \{(1,0,0), (0,1,0), (0,0,1)\}$   $\leftarrow$  3 pure strategies, sum = 1

- *payoff functions:*
  - in order to formulate the payoff functions for both players, we introduce the following functions:

$$\alpha(x, y) = \begin{cases} 1 & \text{for } x > y, \\ \frac{1}{2} & \text{for } x = y, \\ 0 & \text{for } x < y \text{ or } x = y = 0. \end{cases} \quad \beta(x, y) = \begin{cases} 1 & \text{for } x < y, \\ \frac{1}{2} & \text{for } x = y, \\ 0 & \text{for } x > y \text{ or } x = y = 0. \end{cases}$$

- note:  $\alpha(x_i, y_i)$  is the probability of player 1 obtaining object  $i$   
 $\beta(x_i, y_i)$  is the probability of player 2 obtaining object  $i$
- if player 1 obtains  $i$ th object, his total profit rises by  $s_i - x_i$
- payoff functions express the *expected total payoff* for the players:

$$Z_1(\mathbf{x}, \mathbf{y}) = \sum_{i=1}^n (s_i - x_i) \alpha(x_i, y_i), \quad Z_2(\mathbf{x}, \mathbf{y}) = \sum_{i=1}^n (s_i - y_i) \beta(x_i, y_i).$$

## Example 1 (cont'd):

- assume  $\mathbf{x} = (20,0,0)$  and  $\mathbf{y} = (10,0,0)$ , then:

- player 1 wins object 1
- player 2 wins nothing

$$\rightarrow Z_1(\mathbf{x}, \mathbf{y}) = s_1 - x_1 = 40 - 20 = 20$$

$$Z_2(\mathbf{x}, \mathbf{y}) = 0$$

- using the formula for  $Z_1$ :

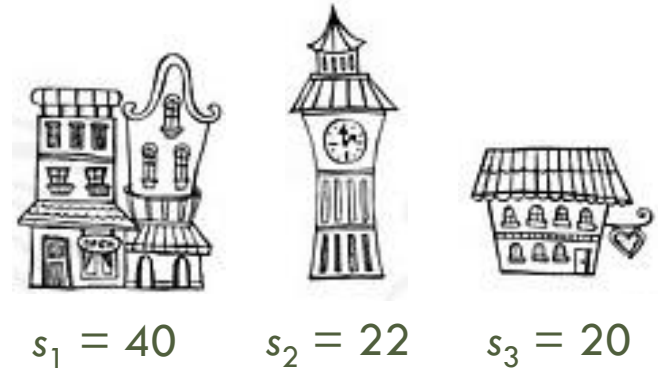
$$Z_1(\mathbf{x}, \mathbf{y}) = \sum (s_i - x_i) \alpha(x_i, y_i) = (40 - 20) \times 1 + (22 - 0) \times 0 + (20 - 0) \times 0$$

(legend: **values**, **bids**, **probabilities**)

- in case  $\mathbf{x} = (10,10,0)$  and  $\mathbf{y} = (10,0,0)$ : player 1 wins object 2; object 1 is decided by a toss of a coin:

$$Z_1(\mathbf{x}, \mathbf{y}) = (40 - 10) \times \frac{1}{2} + (22 - 10) \times 1 + 0 = 27$$

$$Z_2(\mathbf{x}, \mathbf{y}) = (40 - 10) \times \frac{1}{2} + 0 + 0 = 15$$



- game-theoretical solution to the bidding problem – NE again:

*A strategy profile  $(\mathbf{x}^*, \mathbf{y}^*)$  with the property that*

$$Z_1(\mathbf{x}, \mathbf{y}^*) \leq Z_1(\mathbf{x}^*, \mathbf{y}^*),$$

$$Z_2(\mathbf{x}^*, \mathbf{y}) \leq Z_2(\mathbf{x}^*, \mathbf{y}^*)$$

*for all  $\mathbf{x} \in X$  and  $\mathbf{y} \in Y$  is a NE.*

- finite strategy spaces  $\rightarrow$  the auction can be modelled as a bimatrix game
- possible outcomes:
  - unique NE in pure strategies
  - multiple NE's (pure and mixed), no domination
  - multiple NE's (pure and mixed), one dominates the others
  - no pure NE's, (mixed NE's only)

# Exercise 1: Unique Pure-Strategy NE

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1. Formulate the auction from example 1 as a bimatrix game (i.e., find the payoff matrices for both players, and write them down in a single matrix with double entries).
2. Find the NE of the bimatrix game.



$s_1 = 40$



$s_2 = 22$



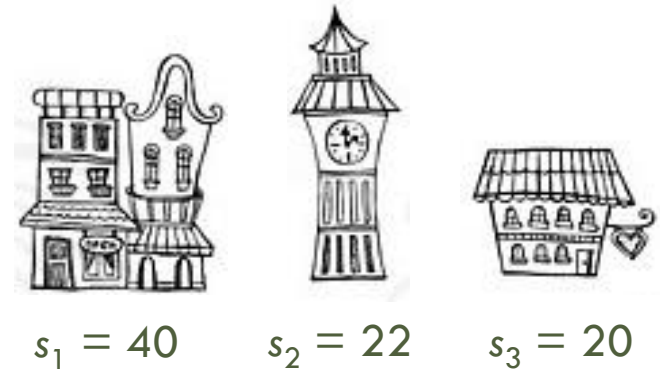
$s_3 = 20$

		Investor 2		
		1,0,0	0,1,0	0,0,1
Investor 1	1 \ 2	1,0,0	0,1,0	0,0,1
	2,0,0	20 ; 0		
	1,1,0	27 ; 15		
	1,0,1			
	0,2,0			
	0,1,1			
	0,0,2			

# Exercise 1: Unique Pure-Strategy NE

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1. Formulate the auction from example 1 as a bimatrix game (i.e., find the payoff matrices for both players, and write them down in a single matrix with double entries).
2. Find the NE of the bimatrix game.



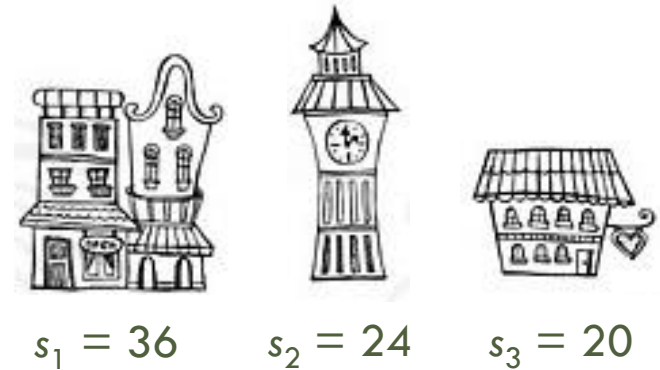
Investor 2

1 \ 2	1,0,0	0,1,0	0,0,1
2,0,0	20 ; 0	20 ; 12	20 ; 10
1,1,0	27 ; 15	36 ; 6	42 ; 10
1,0,1	25 ; 15	40 ; 12	35 ; 5
0,2,0	2 ; 30	2 ; 0	2 ; 10
0,1,1	22 ; 30	16 ; 6	17 ; 5
0,0,2	0 ; 30	0 ; 12	0 ; 0

Investor 1

# Exercise 2: Multiple NE's – Solvable Case

- consider similar auction as in example 1, only that the values of the object are:  $s_1 = 36$ ,  $s_2 = 24$ ,  $s_3 = 20$
- the payoff matrices are in the following table; find *all* NE's for this auction



		Investor 2			
		1 \ 2	1,0,0	0,1,0	0,0,1
Investor 1	2,0,0	16 ; 0	16 ; 14	16 ; 10	
	1,1,0	27 ; 13	33 ; 7	40 ; 10	
	1,0,1	23 ; 13	36 ; 14	31 ; 5	
	0,2,0	4 ; 26	4 ; 0	4 ; 10	
	0,1,1	24 ; 26	17 ; 7	19 ; 5	
	0,0,2	0 ; 26	0 ; 14	2 ; 0	

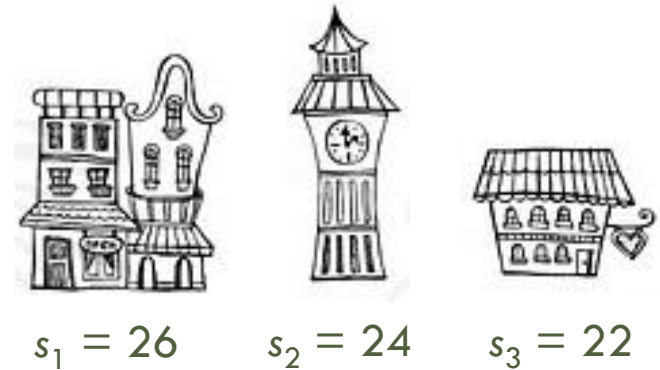
dominated NE (arrow pointing to 27 ; 13)

dominating NE (arrow pointing to 36 ; 14)

# Exercise 3: Multiple NE's

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- consider similar auction as in example 1, only that the values of the object are:  $s_1 = 26$ ,  $s_2 = 24$ ,  $s_3 = 22$
- find the payoff matrices and *all* NE's for this auction



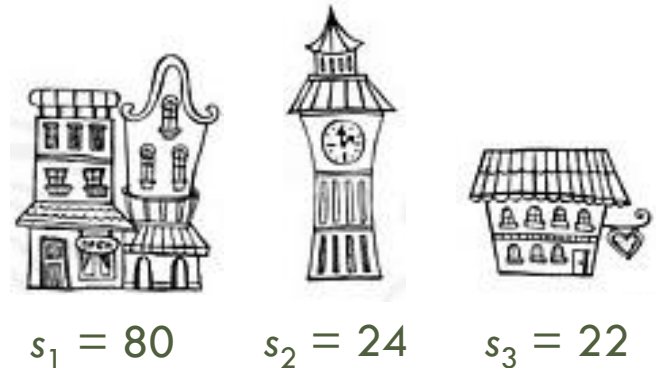
		Investor 2		
		1,0,0	0,1,0	0,0,1
Investor 1	1 \ 2	1,0,0	0,1,0	0,0,1
	2,0,0	6 ; 0	6 ; 14	6 ; 12
	1,1,0	22 ; 8	23 ; 7	30 ; 12
	1,0,1	20 ; 8	28 ; 14	22 ; 6
	0,2,0	4 ; 16	4 ; 0	4 ; 12
	0,1,1	26 ; 16	19 ; 7	20 ; 6
	0,0,2	2 ; 16	2 ; 14	2 ; 0



# Exercise 4: No Pure-Strategy NE

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- consider similar auction as in example 1, only that the values of the object are:  $s_1 = 80$ ,  $s_2 = 24$ ,  $s_3 = 22$
- check that there are no pure-strategy NE's for this auction



		Investor 2		
		1,0,0	0,1,0	0,0,1
Investor 1	1 \ 2	1,0,0	0,1,0	0,0,1
	2,0,0	60 ; 0	60 ; 14	60 ; 12
	1,1,0	49 ; 35	77 ; 7	84 ; 12
	1,0,1	47 ; 35	82 ; 14	76 ; 6
	0,2,0	4 ; 70	4 ; 0	4 ; 12
	0,1,1	26 ; 70	19 ; 7	20 ; 6
	0,0,2	2 ; 70	2 ; 14	2 ; 0

# Mixed Strategies in Auctions

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- from the Nash Existence Theorem, we know that for every bimatrix game there exists at least one NE in mixed strategies
- finding mixed strategies: procedure based on the Equivalence Theorem:

**Equivalence Theorem.** *Let  $\mathbf{A}$  and  $\mathbf{B}$  be  $m \times n$  matrices with positive elements. The vectors  $\mathbf{p}^*$  and  $\mathbf{q}^*$  are non-zero solution of the nonlinear programming problem*

$$\text{maximize } M(\mathbf{p}, \mathbf{q}) = \mathbf{p}^\top (\mathbf{A} + \mathbf{B}) \mathbf{q} - \mathbf{1}_m^\top \mathbf{p} - \mathbf{1}_n^\top \mathbf{q} \quad (1)$$

subject to

$$\begin{aligned} \mathbf{A} \mathbf{q} &\leq \mathbf{1}_m, \\ \mathbf{B}^\top \mathbf{p} &\leq \mathbf{1}_n, \\ \mathbf{p} &\geq \mathbf{0}, \\ \mathbf{q} &\geq \mathbf{0}. \end{aligned} \quad (2)$$

*if and only if  $\mathbf{x}^* = b\mathbf{p}^*$  and  $\mathbf{y}^* = a\mathbf{q}^*$  represent a mixed-strategy NE of the bimatrix game with matrices  $\mathbf{A}, \mathbf{B}$ , where:*

$$1/b = \mathbf{1}_m^\top \mathbf{p}^* = \sum p_i, \quad 1/a = \mathbf{1}_n^\top \mathbf{q}^* = \sum q_i, \quad M(\mathbf{p}^*, \mathbf{q}^*) = 0.$$

- although we can solve the model using *MS Excel Solver* again, there are several problems:
  - non-linear optimization problems may have multiple local extremes, it's advisable to run the algorithm from *different starting points*
  - to solve the auction, we need the equilibrium to be *unique* (or dominant)
  - unfortunately, there are no efficient ways of testing the uniqueness of a mixed strategy equilibrium

- a “relatively reliable” procedure of finding a mixed-strategy NE:

- **Step 1:** solve the optimization problem

$$\text{maximize } \mathbf{1}_m^\top \mathbf{p} + \mathbf{1}_n^\top \mathbf{q} = \sum_{i=1}^m p_i + \sum_{j=1}^n q_j \text{ subject to (2),}$$

keep the optimal solution from step 1 as the starting point for step 2

- **Step 2:** solve the problem: maximize  $M(\mathbf{p}, \mathbf{q})$  subject to (2); denote optimal values of  $\mathbf{p}$  and  $\mathbf{q}$  as  $\mathbf{p}^*$  and  $\mathbf{q}^*$
- **Step 3:** normalize  $\mathbf{p}^*$  and  $\mathbf{q}^*$  from step 2 in order to get NE mixed strategies  $\mathbf{x}^*$  and  $\mathbf{y}^*$  (note: normalize a vector = divide by the sum of its elements)

# Collusive Auctions

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- *collusion* = secret agreement, conspiracy
- *aim of auctions*: generate the maximum revenue for the seller; works only if the bidders compete
- collusion is usually not accepted by the auction rules
- modelling approach: cooperative bimatrix games with transferable payoffs



		Investor 2		
		1,0,0	0,1,0	0,0,1
Investor 1	1 \ 2			
	2,0,0	60 ; 0	60 ; 14	60 ; 12
	1,1,0	49 ; 35	77 ; 7	84 ; 12
	1,0,1	47 ; 35	82 ; 14	76 ; 6
	0,2,0	4 ; 70	4 ; 0	4 ; 12
	0,1,1	26 ; 70	19 ; 7	20 ; 6
	0,0,2	2 ; 70	2 ; 14	2 ; 0

# Collusive Auctions

(cont'd)

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- in order to find the core of the game, we first need:  $v(1)$ ,  $v(2)$ , and  $v(1,2)$
- finding guaranteed payoffs: *eliminate strictly dominated strategies first!*
  - $v(1) = 60$
  - $v(2) = 7$

		Investor 2		
		1,0,0	0,1,0	0,0,1
Investor 1	1 \ 2			
	2,0,0	60 ; 0	60 ; 14	60 ; 12
	1,1,0	49 ; 35	77 ; 7	84 ; 12
	1,0,1	47 ; 35	82 ; 14	76 ; 6
	<del>0,2,0</del>	<del>4 ; 70</del>	<del>4 ; 0</del>	<del>4 ; 12</del>
	<del>0,1,1</del>	<del>26 ; 70</del>	<del>19 ; 7</del>	<del>20 ; 6</del>
	<del>0,0,2</del>	<del>2 ; 70</del>	<del>2 ; 14</del>	<del>2 ; 0</del>

# Collusive Auctions

(cont'd)

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- maximum total payoff =  $v(1,2) = 96$   
(note: dominated strategies are included here!)

- core of the game:
 
$$\begin{aligned} a_1 + a_2 &= 96, \\ a_1 &\geq 60, \\ a_2 &\geq 7. \end{aligned}$$



- superadditive effect:  $v(1,2) - v(1) - v(2) = 96 - 60 - 7 = 29$

1 \ 2	1,0,0	0,1,0	0,0,1
2,0,0	60 ; 0	60 ; 14	60 ; 12
1,1,0	49 ; 35	77 ; 7	84 ; 12
1,0,1	47 ; 35	82 ; 14	76 ; 6
0,2,0	4 ; 70	4 ; 0	4 ; 12
0,1,1	26 ; 70	19 ; 7	20 ; 6
0,0,2	2 ; 70	2 ; 14	2 ; 0



1 \ 2	1,0,0	0,1,0	0,0,1
2,0,0	60	74	72
1,1,0	84	84	<b>96</b>
1,0,1	82	<b>96</b>	82
0,2,0	74	4	16
0,1,1	<b>96</b>	26	26
0,0,2	72	16	2

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